



# International Test & Evaluation LVC Conference

## Capability Test Design and Analysis

January 13, 2009

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<b>Report Documentation Page</b>			<i>Form Approved OMB No. 0704-0188</i>	
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1. REPORT DATE <b>13 JAN 2009</b>	2. REPORT TYPE	3. DATES COVERED <b>00-00-2009 to 00-00-2009</b>		
4. TITLE AND SUBTITLE <b>Capability Test Design and Analysis</b>		5a. CONTRACT NUMBER		
		5b. GRANT NUMBER		
		5c. PROGRAM ELEMENT NUMBER		
6. AUTHOR(S)		5d. PROJECT NUMBER		
		5e. TASK NUMBER		
		5f. WORK UNIT NUMBER		
7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES) <b>Joint Test and Evaluation Methodology (JTEM), Washington, DC, 20301</b>		8. PERFORMING ORGANIZATION REPORT NUMBER		
9. SPONSORING/MONITORING AGENCY NAME(S) AND ADDRESS(ES)		10. SPONSOR/MONITOR'S ACRONYM(S)		
		11. SPONSOR/MONITOR'S REPORT NUMBER(S)		
12. DISTRIBUTION/AVAILABILITY STATEMENT <b>Approved for public release; distribution unlimited</b>				
13. SUPPLEMENTARY NOTES <b>Live-Virtual Constructive Conference, 12-15 Jan 2009, El Paso, TX</b>				
14. ABSTRACT				
15. SUBJECT TERMS				
16. SECURITY CLASSIFICATION OF:			17. LIMITATION OF ABSTRACT <b>Same as Report (SAR)</b>	
a. REPORT <b>unclassified</b>	b. ABSTRACT <b>unclassified</b>	c. THIS PAGE <b>unclassified</b>	18. NUMBER OF PAGES <b>24</b>	19a. NAME OF RESPONSIBLE PERSON

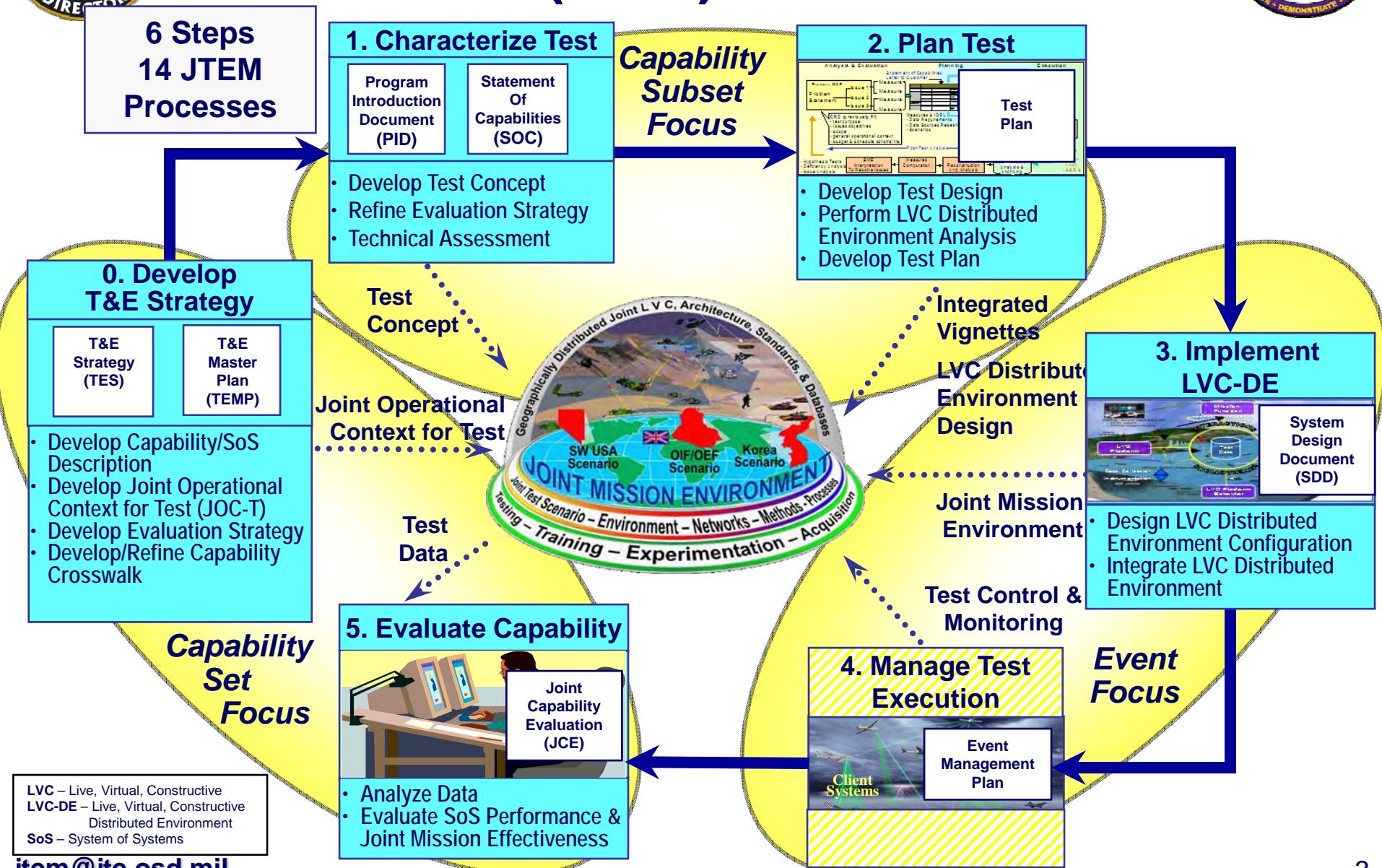


# Capability Test Design & Analysis Objectives

- 1. Discuss the concept of conducting a capability evaluation strategy refinement process for testing in a joint environment (TIJE)**
- 2. Review the methods and processes for an evaluation strategy refinement process**
- 3. Review potential design of experiment techniques for large number of factors**
- 4. Review tools and techniques for an evaluation strategy refinement process**
- 5. Step through a “case study” example of an evaluation strategy refinement process**
- 6. Review potential issues and insights**



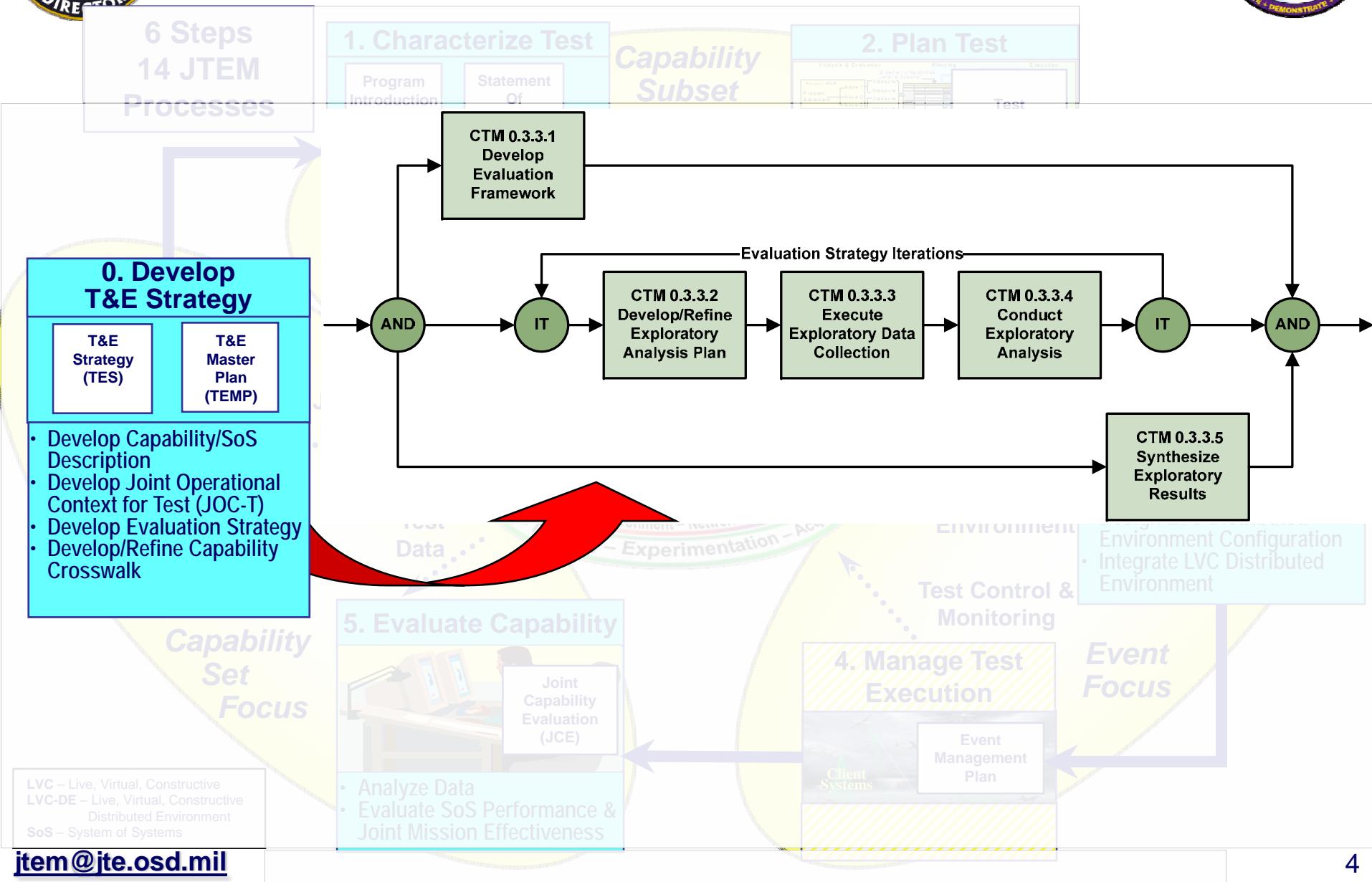
# JTEM Capability Test Methodology (CTM) v2.0





# JTEM CTM 0.3.3

## (Develop Evaluation Strategy)





# Exploratory Analysis Purpose

Factor	Factor Range
Factor 1	$X_{1\min} \longrightarrow X_{1\max}$
Factor 2	$X_{2\min} \longrightarrow X_{2\max}$
Factor 3	$X_{3\min} \longrightarrow X_{3\max}$
Factor 4	$X_{4\min} \longrightarrow X_{4\max}$
Factor 5	$X_{5\min} \longrightarrow X_{5\max}$
Factor 6	$X_{6\min} \longrightarrow X_{6\max}$
Factor 7	$X_{7\min} \longrightarrow X_{7\max}$
Factor 8	$X_{8\min} \longrightarrow X_{8\max}$
Factor 9	$X_{9\min} \longrightarrow X_{9\max}$
Factor 10	$X_{10\min} \longrightarrow X_{10\max}$

Initial JMe Factor Test Space

Factor ranges of interest

Refined factor ranges of interest

Factors eliminated from further consideration

Factor	Factor Range
Factor 1	$X_{1\min} \longrightarrow X_{1\max}$
Factor 2	$X_{2\min} \longrightarrow X_{2\max}$
Factor 3	$X_{3\min} \longrightarrow X_{3\max}$
Factor 4	$X_{4\min} \longrightarrow X_{4\max}$
Factor 5	$X_{5\min} \longrightarrow X_{5\max}$
Factor 6	$X_{6\min} \longrightarrow X_{6\max}$
Factor 7	$X_{7\min} \longrightarrow X_{7\max}$
Factor 8	$X_{8\min} \longrightarrow X_{8\max}$
Factor 9	$X_{9\min} \longrightarrow X_{9\max}$
Factor 10	$X_{10\min} \longrightarrow X_{10\max}$

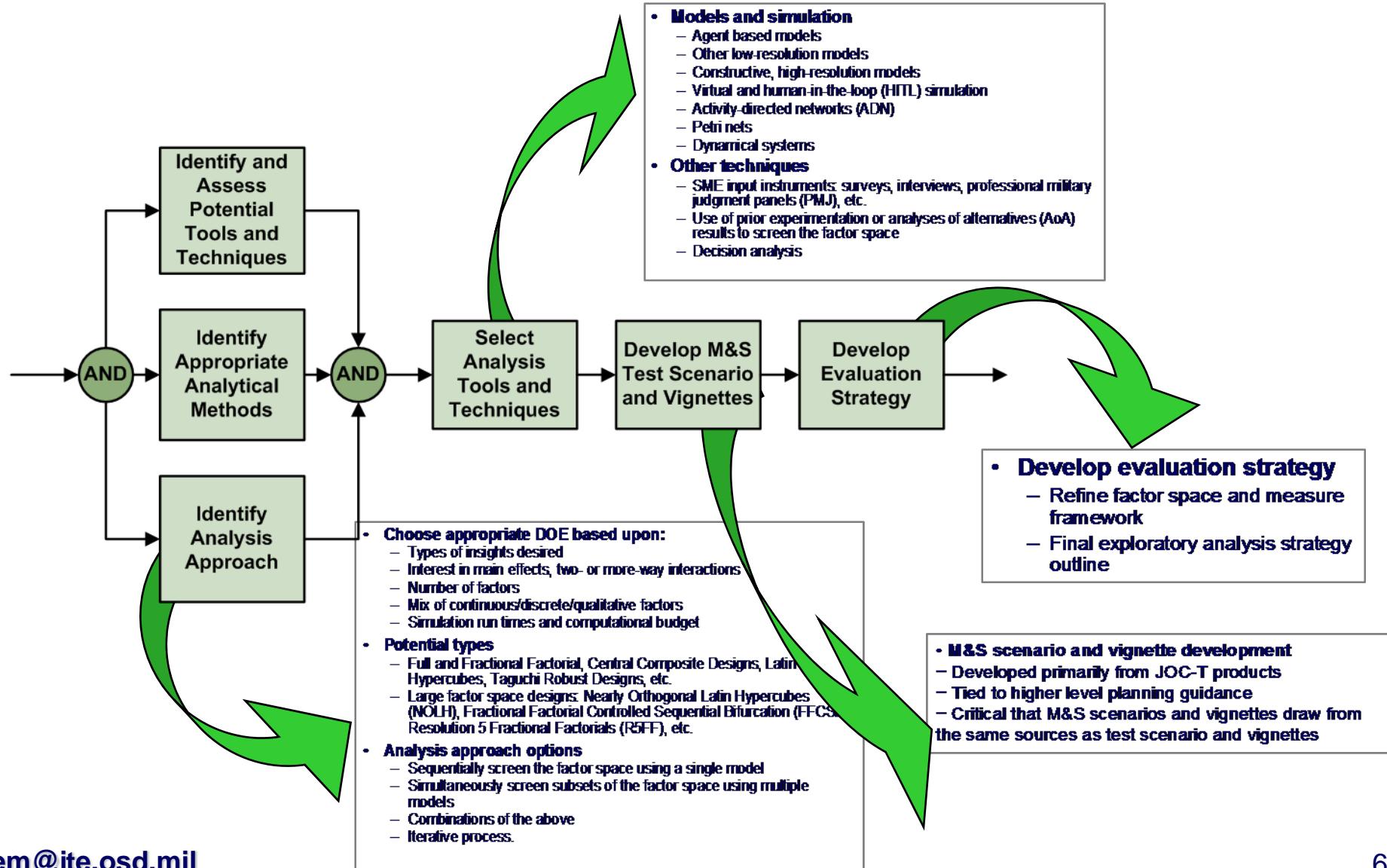
Refined JMe Factor Test Space

## Purpose is three-fold:

- To explore a wide range of possible factors and levels that might affect joint mission effectiveness (JMe), referred to as the initial JMe factor test space;
- To identify those combinations of factors that have the greatest impact on JMe, referred to as the refined JMe factor test space; and
- To recommend potential factor combinations of interest from the refined JMe factor test space for subsequent test events, referred to as potential test trial sets.

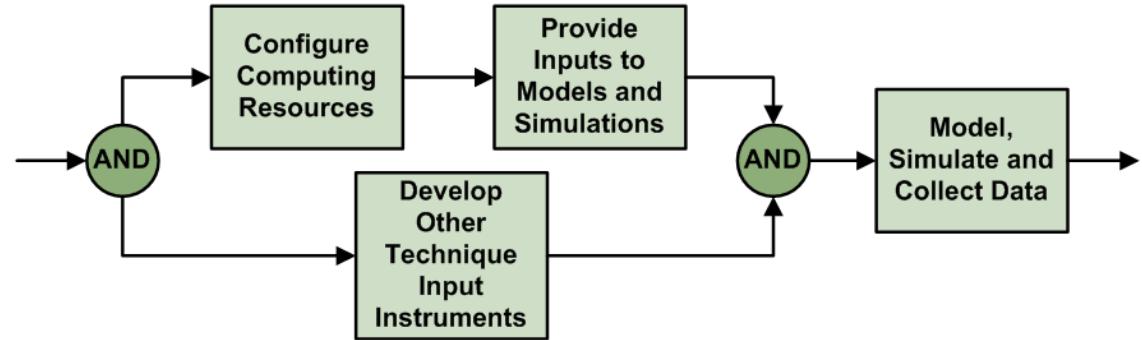


# CTM 0.3.3.2: Develop/Refine Exploratory Analysis Plan





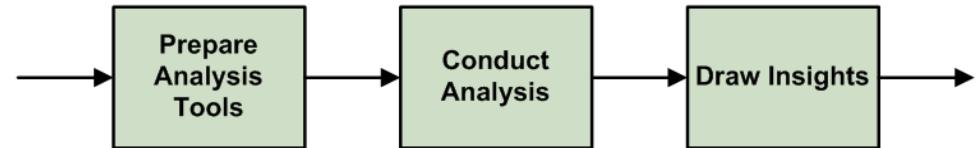
# CTM 0.3.3.3: Execute Exploratory Data Collection



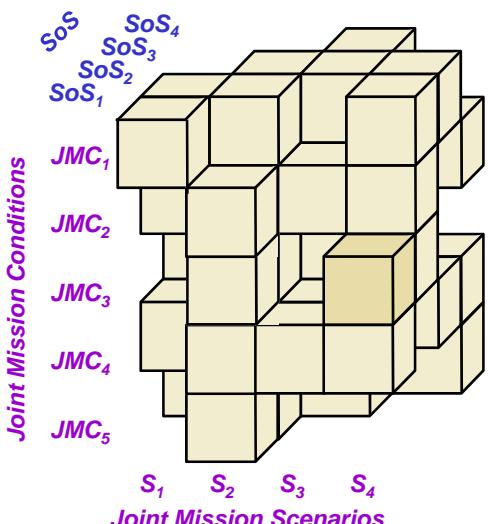
- Depending upon tools and methods chosen, configuration of computing resources may be quite involved.
- Other instruments of data collection are also developed here (surveys, interview scripts, PMJ panel planning, etc.).
- Analysts develop model inputs (scenario files, DOE input files, data output specifications, etc.) to execute the data collection.
- Model runs and data collection are executed according to exploratory analysis strategy.



# CTM 0.3.3.4: Conduct Exploratory Analysis



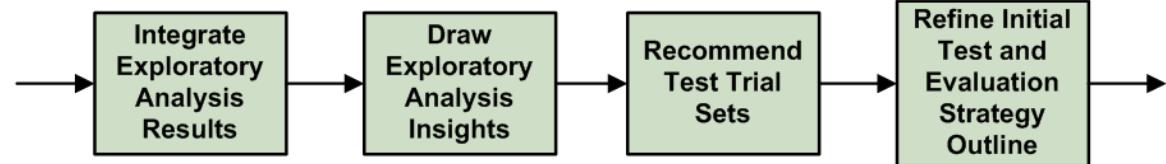
- Identify and select appropriate tools and techniques to conduct the analysis.
- Evaluate measure responses from exploratory runs to refine the JMe factor test space.
- Identify factors to explore during next iteration, as required.
- Potential analyses involved in these steps will be discussed in more detail as part of CTM 5, Evaluate Capability, since similar analytic methods will be used as part of both processes.



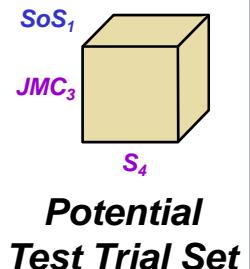
**Refined JMe Factor Test Space**



# CTM 0.3.3.5: Synthesize Exploratory Analysis Results



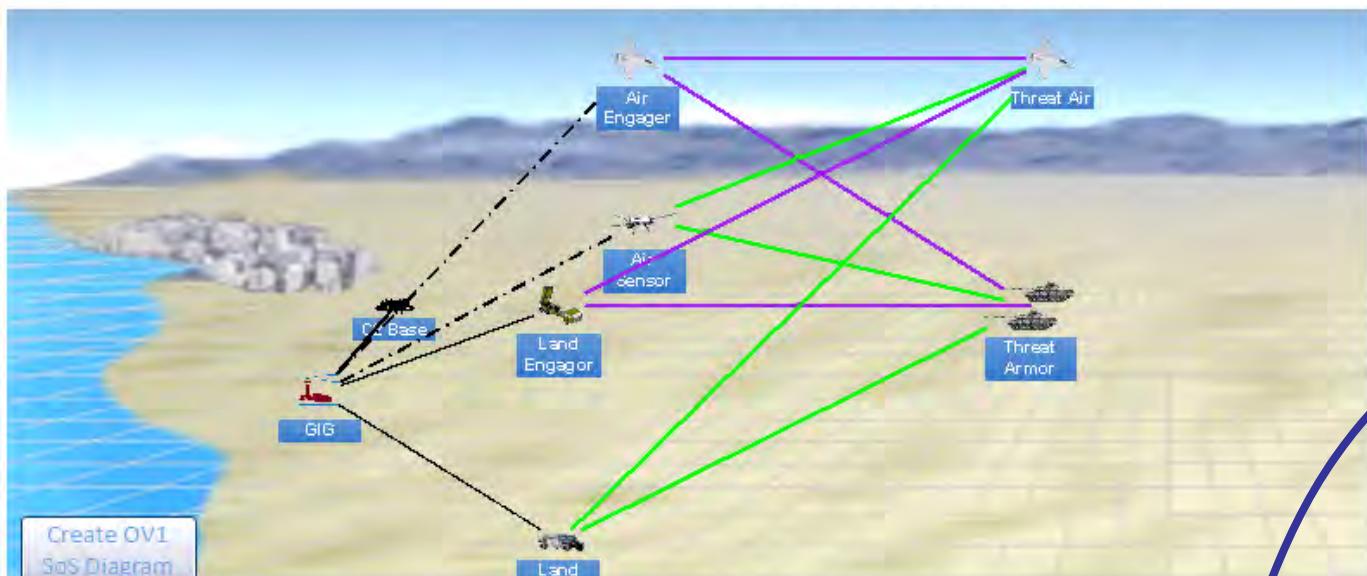
- This set of processes integrates the analyses conducted during the multiple exploratory iterations to draw insights about the “probable” factor space and the measure framework.
- The result should be a final refined factor space consisting of potential test trial sets of interest for subsequent testing.
- Must integrate model related data and qualitative data obtained from SMEs.
- Insights from the analysis will help inform the risk assessment conducted in the next step of the CTM.
  - Potential contributors to risk include the assumptions made during modeling, the capabilities of the models, the measures chosen, etc.
  - Subsequent tests can help validate assumptions made.





# Case Study Example

## High Level Operational View (OV-1)



System of Systems  
(SoS)

Task

to achieve

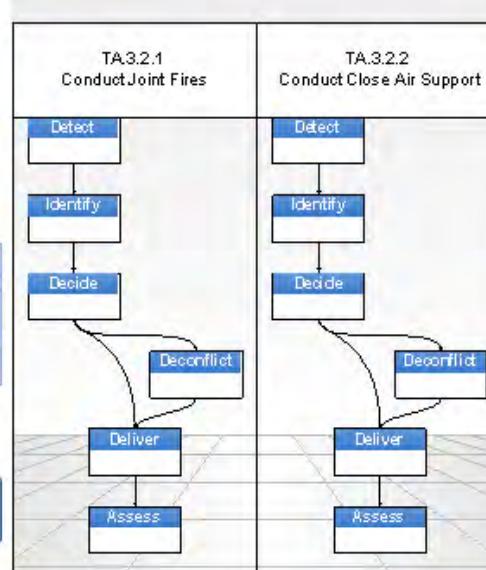
Mission Desired Effect

SystemSoS		SystemSoS Name
IDFW SoS 1		C2 Capability System of Systems
Record:	1 of 1	

to perform

UJTL Number	Task Name
TA.3.2.1	Conduct Joint Fires
TA.3.2.2	Conduct Close Air Support

Create OV1  
Task Diagram



Desired Effect		Desired Effect Name
IDFW MDE 1		Threat Platform Ineffectiveness
Record:	1 of 1	



# Develop Evaluation Framework



## Case Study Example

### Mission Measures of Effectiveness

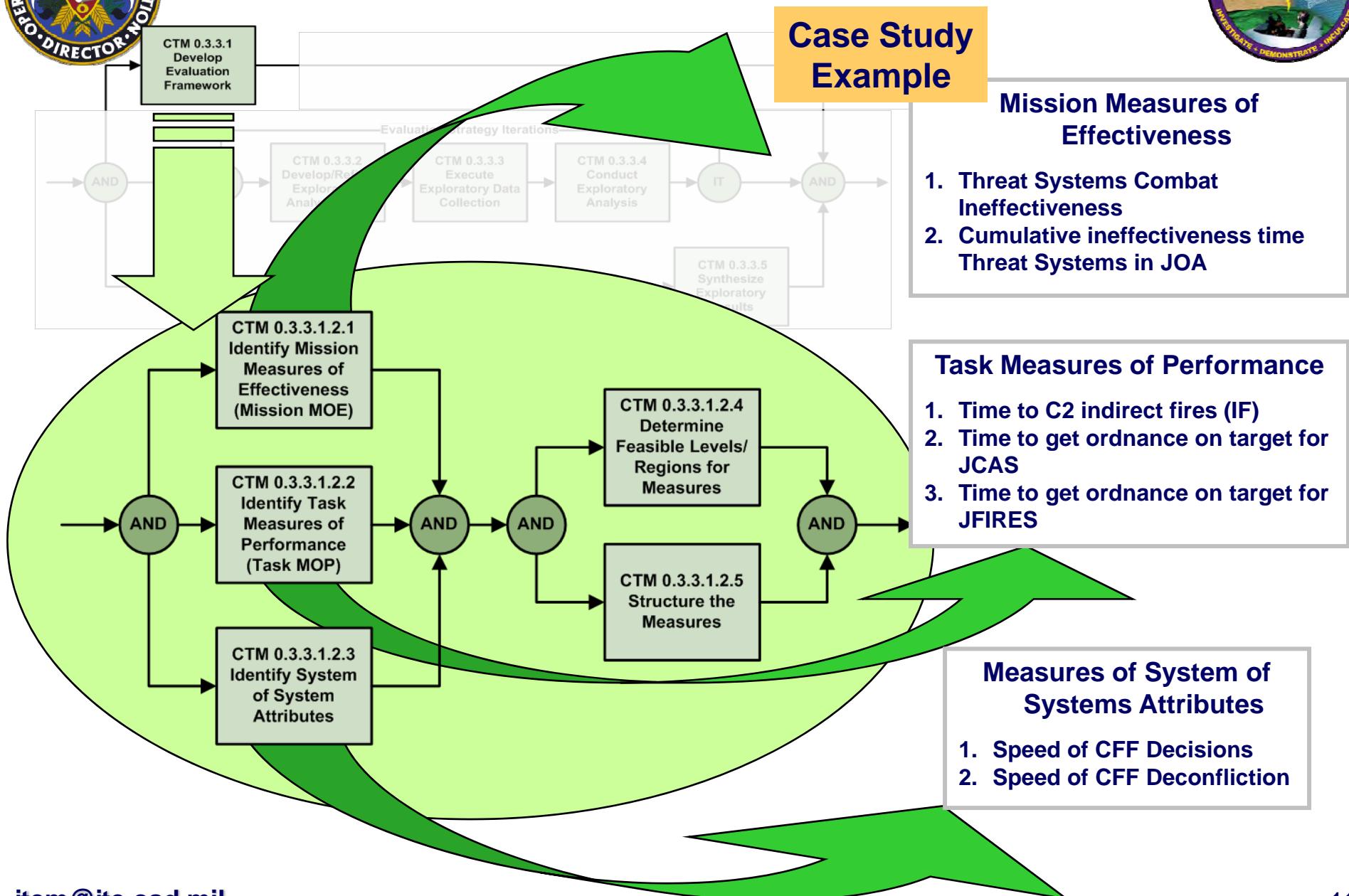
1. Threat Systems Combat Ineffectiveness
2. Cumulative ineffectiveness time Threat Systems in JOA

### Task Measures of Performance

1. Time to C2 indirect fires (IF)
2. Time to get ordnance on target for JCAS
3. Time to get ordnance on target for JFIRES

### Measures of System of Systems Attributes

1. Speed of CFF Decisions
2. Speed of CFF Deconfliction





# Agent Based Model

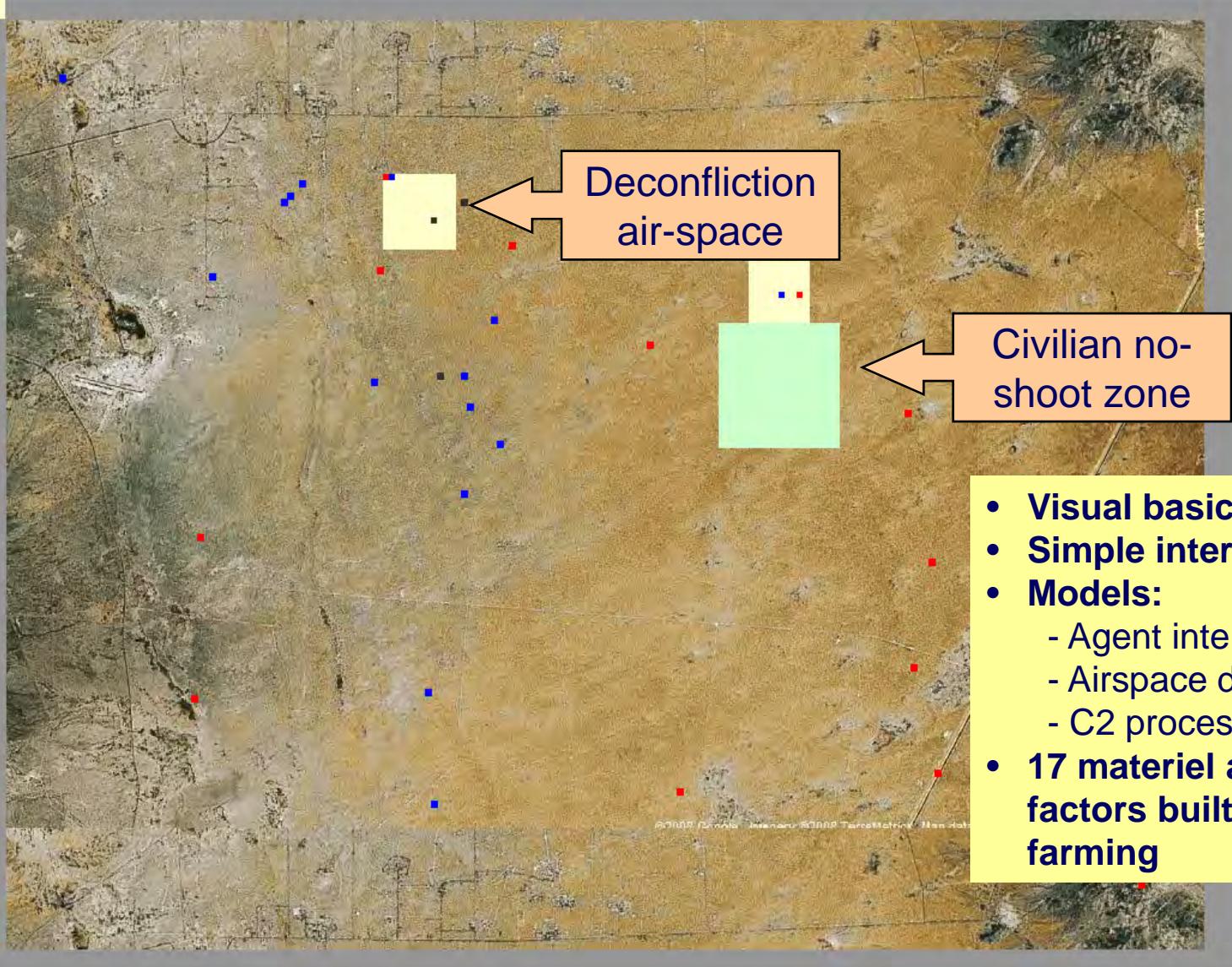
Case Study  
Example

Run

Trial # = 1

Run # = 1

Time = 4,440



- Visual basic code
- Simple interface
- Models:
  - Agent interactions
  - Airspace deconflicts
  - C2 processes
- 17 materiel and non-materiel factors built in for data farming



# Factor Capability Crosswalk SME Estimates



Crosswalk Dimension	Crosswalk Sub Dimension	Factor	Levels	Factor Type
System of Systems	Materiel	1. Global Information Grid (GIG)?	Yes/No	Categorical
		2. Blue Speed	1/2 (Multiplier)	Continuous
		3. Blue Monitor	1/2 (Multiplier)	Continuous
		4. Blue Fires	1/2 (Multiplier)	Continuous
	Non-materiel: Doctrine	5. Multiple Trackers?	Yes/No	Categorical
		6. Expedited Call For Fire?	Yes/No	Categorical
		7. Call For Fire type Decision	A/C	Categorical
		8. Expedite Move	Yes/No	Categorical
		9. Restricted Op. Zone Type	Restrictive/Permissive	Categorical
		10. ROZ Size	1/2 (Multiplier)	Continuous
		11. ROZ Expiration	Yes/No	Categorical
		12. ROZ Slack Time	1/2 (Add. Time Increments)	Continuous
		13. Multi-Service Wait time	1/2 (Add. Time Increments)	Continuous
Condition	Environmental	14. Adverse Weather?	Yes/No	Categorical
		15. Civilian Zone?	Yes/No	Categorical
		16. Civilian Zone Size	20/40	Continuous
		17. Civilian Zone Location	1/2	Categorical
17 Factors with 3 dependencies				7 Continuous/ 10 Categorical

**Case Study Example**



# Step 1: “Quick Look” Analysis

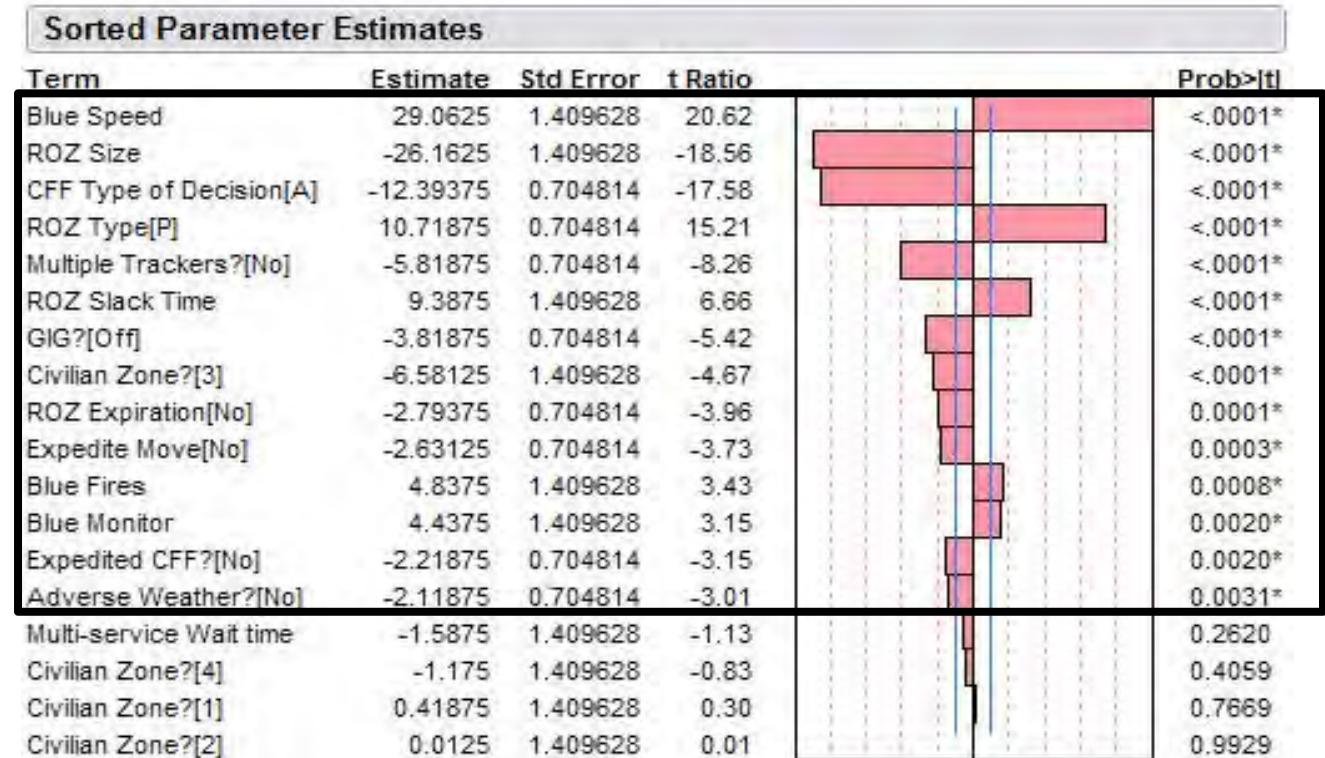
Dependent Variable: Number Threat Kills

Independent Variables: 17 factors (decision & conditional)

DOE: Resolution III Fractional Factorial (80 trials, 20 runs each)

Analysis tools: Stepwise Regression Model

SME Estimate  
X      X      X      X



Significant factors

Non-Significant factors

## Findings:

- 14 factors significant, 3 factors not significant
- Adverse weather factor non-intuitive



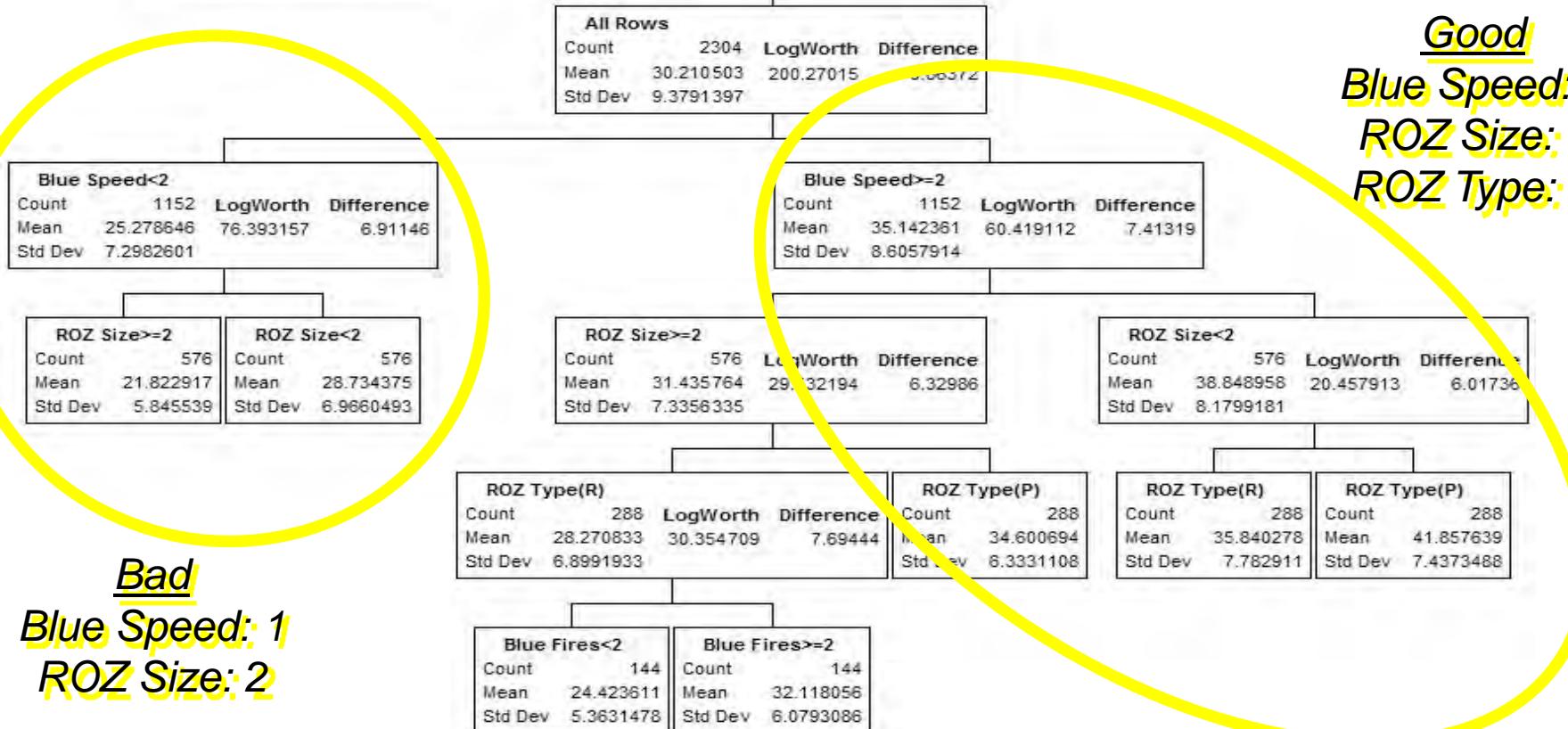
# Step 2: Main Effects Analysis

Dependent Variable: Number Threat Kills

Independent Variables: 14 factors (decision & conditional)

DOE: Resolution V Fractional Factorial (2304 trials, 3 runs each)

Analysis tools: Classification and Regression Tree (CART) partitioning



## Findings:

- Stressing factors (Blue speed, ROZ size, ROZ type)



# Step 2: Main Effects Analysis

Dependent Variable: Number Threat Kills

Independent Variables: 14 factors (decision & conditional)

DOE: Resolution V Fractional Factorial (2304 trials, 3 runs each)

Analysis tools: Stepwise Regression Model

SME  
Estimate

X

X

X

X

Sorted Parameter Estimates				
	Term	Estimate	Std Error	t Ratio
	Blue Speed	9.8637153	0.243801	40.46
	ROZ Size	-7.162326	0.243801	-29.38
	ROZ Type[P]	2.4657118	0.1219	20.23
	GIG? [Off]	-1.751302	0.1219	-14.37
	CFF Type of Decision[A]	-1.508247	0.1219	-12.37
	Multiple Trackers? [No]	-1.313802	0.1219	-10.78
	Civilian Zone? [No]	1.3897569	0.172393	8.06
	Civilian Zone? [Yes20]	1.0837674	0.172393	6.29
	Expedite Move [No]	-0.455295	0.1219	-3.73
	Adverse Weather? [No]	0.3658854	0.1219	3.00
	Expedited CFF? [No]	-0.30599	0.1219	-2.51
	ROZ Expiration [No]	-0.325087	0.172393	-1.89
	Blue Monitor	-0.426215	0.243801	-1.75
	Multi-service Wait time	-0.243924	0.243801	-1.00
	Blue Fires	0.0894097	0.243801	0.37
	ROZ Expiration [Yes1]	-0.03342	0.172393	-0.19

Prob>|t|

<.0001\*

<.0001\*

<.0001\*

<.0001\*

<.0001\*

<.0001\*

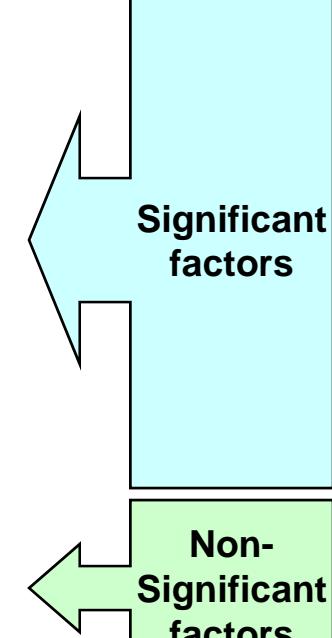
<.0001\*

<.0001\*

0.0002\*

0.0027\*

0.0121\*



## Findings:

- 10 factors significant
- Blue fires no longer significant
- Adverse weather factor intuitive



## Step 2: Main Effects & Two-way Interaction

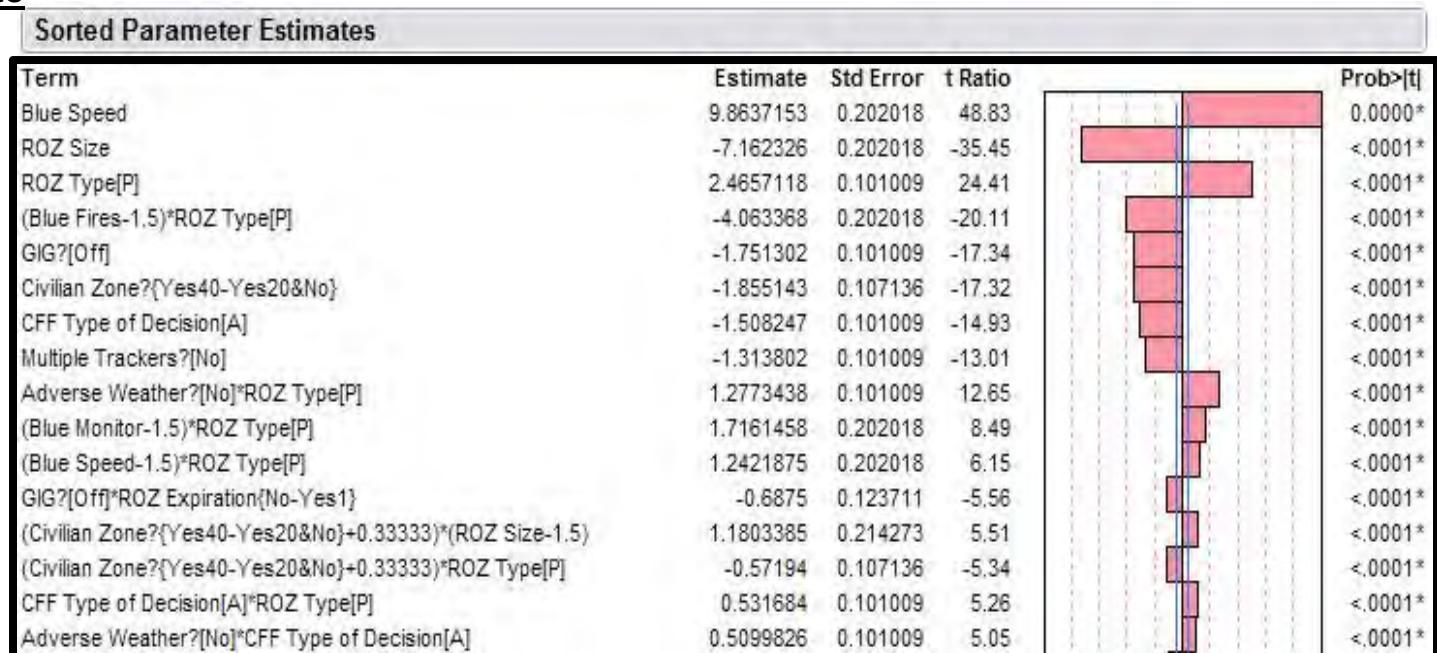
Dependent Variable: Number Threat Kills

Independent Variables: 14 factors (decision & conditional)

DOE: Resolution V Fractional Factorial (2304 trials, 3 runs each)

Analysis tools: Stepwise Regression Model

SME  
Estimate



Significant factors

### Findings:

- 6 main effect factors significant
- 5 additional factors significant in two-way interactions
- Blue fires & adverse weather part of two-way interactions



# Step 3: Aggregated Conditional Factors

Dependent Variable: Number Threat Kills

Independent Variables: 10 factors (9 decision, 1 conditional)

DOE: Resolution V Fractional Factorial (128 trials, 3 runs each)

Analysis tools: Classification and Regression Tree (CART) partitioning

Bad  
**Stressing Factor:** Most Blue Speed: 1  
**GIG?:** Off

RSquare	II	Number of Splits
0.771	128	9

## Case Study Example

Good  
**Stressing Factor:** Least Blue Speed: 2  
**CFF Type Decision:** C  
**ROZ Type:** P

All Rows	Count	128	LogWorth	Difference
Mean	102.375	13.892196	35.1875	
Std Dev	31.096497			

### (5 Factor Least Stressing Levels)

Count	64	LogWorth	Difference
Mean	84.78125	5.994603	23.5
Std Dev	22.648781		

Blue Speed<2

Count	32	LogWorth	Difference
Mean	73.03125	4.1947918	21.9375
Std Dev	18.767653		

Blue Speed>=2

Count	32	LogWorth	Difference
Mean	96.53125	2.9392673	20.4375
Std Dev	20.130196		

GIG?(Off)

Count	16	LogWorth	Difference
Mean	62.0625	84	
Std Dev	10.266247		

GIG?(On)

Count	16	LogWorth	Difference
Mean	5.3125	106.75	4.2011102
Std Dev	1.284748	17.774514	28

ROZ Type(R)	ROZ Type(P)
Count	8
Mean	92.75

All Rows	Count	64	LogWorth	Difference
Mean	119.95875	12.671298	38.125	
Std Dev	28.415829			

Blue Speed<2

Count	32	LogWorth	Difference
Mean	100.90625	4.2290919	20.4375
Std Dev	17.43256		

Blue Speed>=2

Count	32	LogWorth	Difference
Mean	139.03125	2.7937483	24.0625
Std Dev	24.225399		

CFF Type of Decision(A)

Count	16	LogWorth	Difference
Mean	90.6675	111.12	
Std Dev	14.286211	14.183911	

CFF Type of Decision(A)

Count	16	LogWorth	Difference
Mean	127	2.9132009	34
Std Dev	24.144012		

CFF Type of Decision(C)

ROZ Type(R)	ROZ Type(P)
Count	8
Mean	110



# Step 3: Aggregated Conditional Factors Results

## Sorted Parameter Estimates

Term	Estimate	Std Error	t Ratio	Prob> t
<b>(5 Factor Least Stressing Levels)</b>	17.59375	1.122227	15.68	<.0001*
Blue Speed	30.8125	2.244455	13.73	<.0001*
(Blue Fires-1.5)*ROZ Type[P]	-15.8125	2.244455	-7.05	<.0001*
ROZ Type[P]	6.375	1.122227	5.68	<.0001*
CFF Type of Decision[A]	-6.296875	1.122227	-5.61	<.0001*
GIG? [Off]	-5.90625	1.122227	-5.26	<.0001*
Multiple Trackers? [No]	-5.59375	1.122227	-4.98	<.0001*

Dimension	Sub Dimension	Priority/Factor	Levels	Factor Type
System of Systems	Materiel	1. Blue Speed	1/2 (Multiplier)	Continuous
		2. Blue Fires	1/2 (Multiplier)	Continuous
		5. Global Information Grid (GIG)?	Yes/No	Categorical
		3. Restricted Op. Zone Type	Restrictive/Permissive	Categorical
		4. Call For Fire type Decision	A/C	Categorical
		6. Multiple Trackers?	Yes/No	Categorical
	Non-materiel: Doctrine	Most Stress 1. ROZ Size	1 (Multiplier)	Continuous
		Most Stress 2. ROZ Expiration	No	Categorical
Condition	Environmental	Most Stress 3. Multi-Service Wait time	2 (Additional Time Increment)	Continuous
		Most Stress 4. Adverse Weather?	Yes	Categorical
	Environmental	Most Stress 5. Civilian Zone?	Yes (Size = 40)	Categorical

### Findings:

- One aggregated condition factor significant
- Six decisional factors significant



# Step 1: Measures Relationship Table



## Case Study Example

Green: Direct relationship  
Red: Indirect relationship  
No color: No relationship

Factors	Values	M	M	T	T	T	M	M	M	M	M	M	M	M	T	T	T	T	T	T
		M	M	M	M	M	O	O	M	M	M	M	M	M	T	T	T	T	T	T
GIG	Off or On	1	1	1	1	1	0	1	1	1	1	1	1	0	1	0	1	0	1	0
Blue Speed	1 or 2	1	1	1	0	0	1	0	1	0	0	1	0	0	1	0	1	0	0	0
Blue Monitor	1 or 2	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Blue Fires	1 or 2	1	1	0	-1	0	1	-1	0	-1	0	0	-1	0	1	-1	1	-1	0	0
Civilian Zone	Off or On	0	0	1	0	1	1	1	0	0	0	0	0	0	0	0	1	1	0	0
Civilian Zone Size	Small or Large	-1	-1	-1	0	0	-1	0	1	0	0	1	0	0	1	0	1	0	0	0
Multiple Trackers	No or Yes	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Adverse Weather	No or Yes	1	1	1	1	0	0	1	1	1	0	1	1	0	0	1	0	1	0	1
Expedited CFF	No or Yes	1	1	0	1	0	0	0	0	1	0	0	1	0	0	0	0	0	0	0
CFF Type of Decision	Closest or Available	-1	-1	1	1	1	1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	1	1	1
Expedite Move	No or Yes	1	1	1	-1	0	1	0	1	-1	0	1	-1	0	1	0	1	0	-1	0
ROZ Type	Restrictive or Permissive	1	1	1	1	1	1	-1	1	1	1	1	1	-1	1	-1	1	-1	1	-1
ROZ Size	1 or 2	-1	-1	-1	0	0	-1	1	1	0	0	1	0	0	1	-1	1	-1	1	0
Multi-service Wait time	1 or 2	0	0	0	1	0	1	0	0	0	0	0	0	0	0	0	0	0	1	0
ROZ Expiration	No or Yes	1	1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	-1	1	1	1	1
ROZ Slack Time	1 or 2	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Civilian Zone Location	1 or 2	0	0	-1	0	-1	-1	-1	0	0	0	0	0	0	0	0	1	1	0	0

### Findings (Direct and Indirect relationships):

- Direct relationship for all measures: Blue Monitor, Multiple Trackers, ROZ Slack Time
- Indirect relationship for MMOEs and TMOPs/MOSAs: CFF Type of Decision, ROZ Expiration
- Direct relationship across both MMOEs



# Insights into Exploratory Analysis

- Resolution V DOE needed for assessing two-way interactions
  - Resolution III does not confound main effects with one another, but does confound main effects with 2-factor interactions
  - Resolution V does not confound main effects and 2-factor interactions, but confounds main with 4-factor and 2-factor with 3-factor
- Factor prioritization is an iterative process
  - Initial DOE and data farming may provide first insights into significant measures
  - May require further exploration to validate initial findings
  - May differ across multiple measures and require retaining uncertain factors in the second design
  - Iterative farming can provide additional prioritization of factors
- Factors with more than two discrete levels requires additional farming to assess their impact
  - Requires crossing with additional factors
  - May wish to assume two levels for initial design
- Multiple measures (dependent variables) adds significant complexity to determining factors with highest impact
  - Requires evaluation of factors across measures
  - Constructing relationship tables provides insights on measure impacts



# Summary

- Exploratory analysis requires an iterative process for prioritizing factors
- Factors can be analyzed across multiple dependent variables (measures)
- Automated tools for DOE and modeling can help to simplify the exploratory analysis process
- Non-materiel factors can be equally important to testing a System of Systems



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# Abstract

The Joint Test and Evaluation Methodology (JTEM) project has been collaborating with various government organizations and academia to develop enhanced Design of Experiment (DOE) modeling and analysis approaches for Testing in a Joint Environment (TIJE). This paper discusses the applied research that has been conducted in this area over the past three years, as well as its application to JTEM test events. Discoveries involving enhanced data farming techniques and technology applications have proven to be catalysts for test and evaluation of complex adaptive systems. Hybrid DOE models for large factor test designs (e.g., Fractional Factorial Controlled Sequential Bifurcation, Resolution Five Fractional Factorial, Nearly Orthogonal Latin Hypercube) have demonstrated success in refining robust Joint test spaces. Innovative application of analytical models and methodologies (e.g., Advanced Response Surface Methodology, Classification and Regression Tree) have improved our ability to analyze Critical Capability Issues (CCI) involving multiple responses. Agent based model simulation prototypes (e.g., Tester, MANA, Pythagoras) have been modified and/or developed by our academic and government partners to enable enhanced test design and evaluation of capabilities in a Joint environment. Proof of concept efforts in this collaboration has included International Data Farming Workshop (IDFW) events, where various techniques and tools have been explored for use in Testing in a Joint Environment (TIJE). Key research techniques and selected results are presented in the context of a use case that is based upon JTEM test events.